#### **Data Mining Process**

Carlos Soares

(partly using materials kindly provided by José Luís Borges)



Introduction to Data Mining

#### reminder: data mining?



- (or Knowledge Discovery in Databases)
- Is the non-trivial process of identifying
  - implicit (by contrast to explicit)
  - valid (patterns should be valid on new data)
  - novel (novelty can be measured by comparing to expected values)
  - potentially useful (should lead to useful actions)
  - understandable (to humans)
- patterns in data
- Data Mining
  - is a step in the KDD process
  - (arguable, but who cares anyway!...)

### the KDD process



#### Knowledge Evaluation and Presentation **Data Mining** Selection and **Transformation** Cleaning and DW **Integration** DB

#### wanted: DM methodology



- Framework for recording experience
  - Allows projects to be replicated
- Aid to project planning and management
- "Comfort factor" for new adopters
  - Demonstrates maturity of Data Mining
  - Reduces dependency on "stars"
- Encourage best practices and help to obtain better results

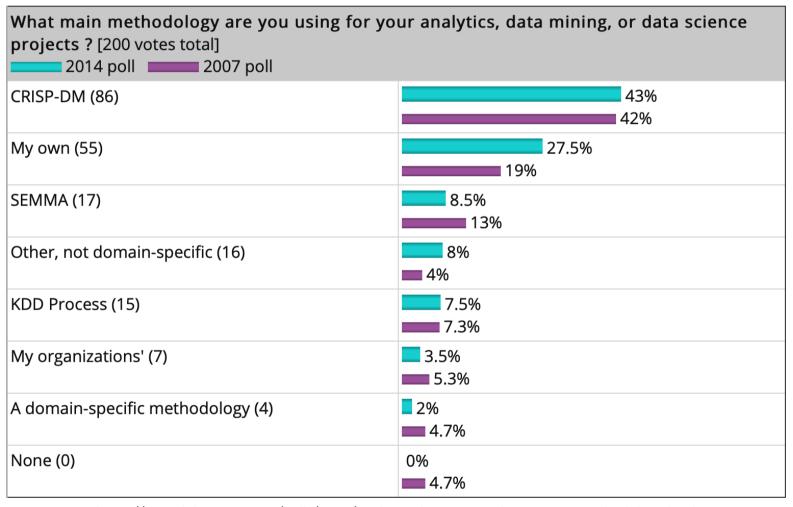
#### plan



- methodologies
  - CRISP-DM
  - SCRUM-DM
- ... and beyond
  - MLOps

#### why CRISP-DM?



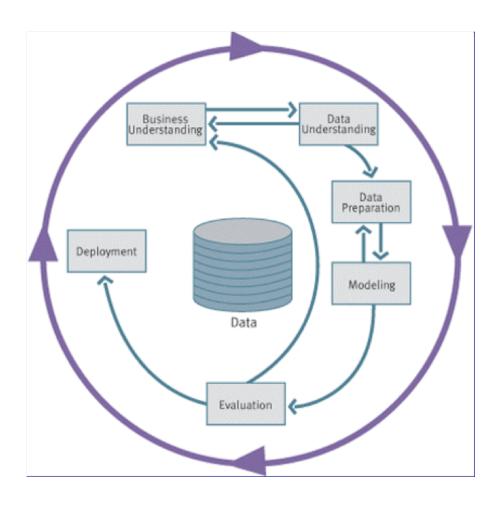


https://www.kdnuggets.com/polls/2014/analytics-data-mining-data-science-methodology.html

#### CRISP-DM: overview

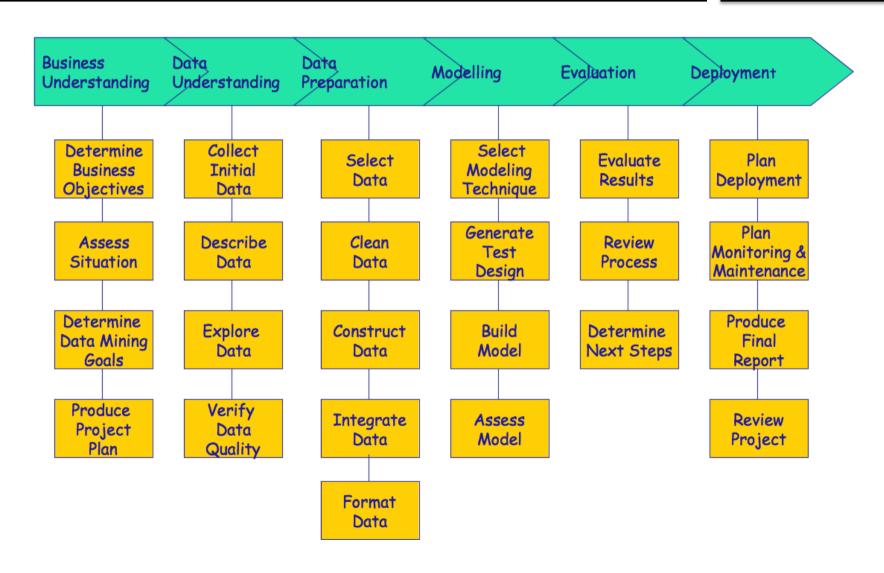


- cross-Industry Standard Process for Data Mining (CRISP-DM)
- European Community funded effort aiming to
  - cheaper, faster, and more reliable data mining
  - widespread adoption
  - reduce skills required for data mining
  - capture experience for reuse
- characteristics
  - non-proprietary
  - application/industry neutral
  - tool neutral
  - focus on business issues
    - as well as technical analysis
  - framework for guidance
  - experience based
    - templates for analysis



### CRISP-DM: phases and tasks





#### other methodologies



#### SEMMA

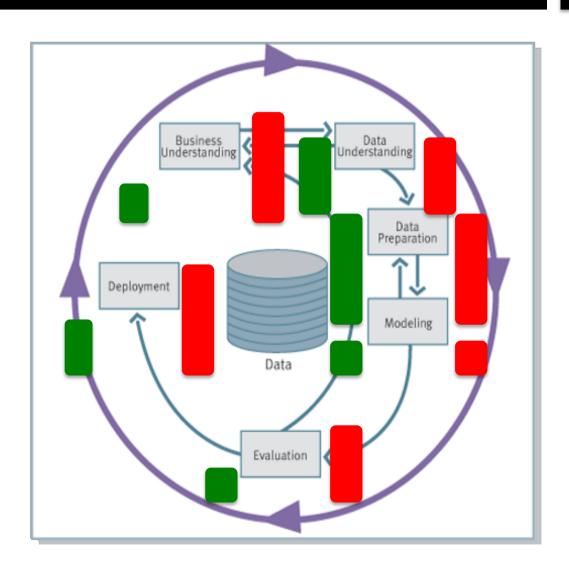
- http://www.sas.com/offices/europe/uk/technologies/anal ytics/datamining/miner/semma.html
- SAS Enterprise Miner

#### Others

- specific
- http://datalligence.blogspot.com/2008/12/data-mining-methodologies.html
- Essentially equivalent

## effort/impact on success





carlos soares - ML 10

# SCRUM-DM: an agile DM methodology

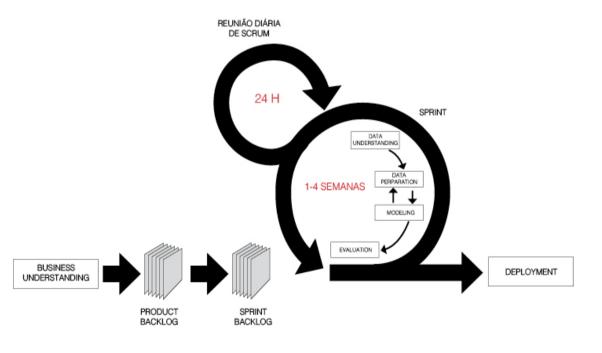


Scrum work management



CRISP-DM Data Mining

- 3 phases
  - Business Understanding
  - Sprint
  - Deployment
- 6 concepts
  - Product Owner
  - Scrum Master
  - Development team
  - Data Mining Story
  - Product Backlog
  - Sprint Backlog



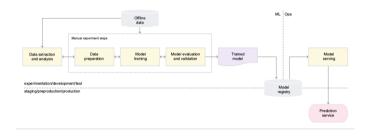
M.Sc. of Diogo Nogueira, joint work with Ana Barros, Paula Gomes and Ademar Aguiar

carlos soares - ML 11

# AI/ML is not (only) software engineering



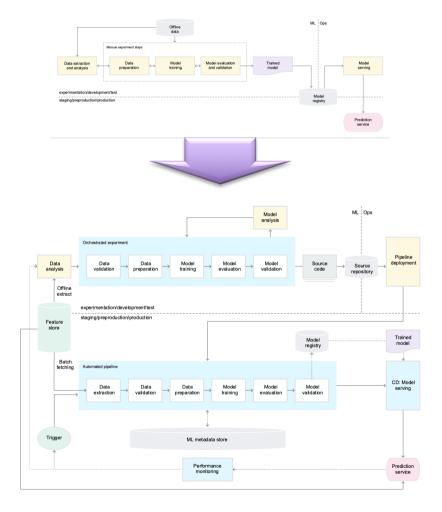
- versioning
  - data
  - model
- automation
  - development
  - testing
- collaborative model development
- deployment
  - monitoring
  - maintenance



### the time for AI/MLOps



- methodologies
  - Microsoft's Team Data Science Process
    - https://docs.microsoft.com/enus/azure/architecture/data-scienceprocess/overview
  - Google's Practitioners guide to MLOps: A framework for continuous delivery and automation of machine learning
    - https://services.google.com/fh/files/ misc/practitioners guide to mlops whitepaper.pdf
- tools
  - MLFlow
    - https://mlflow.org/
  - Kubeflow
    - https://www.kubeflow.org/
  - Data Version Control & Studio
    - https://studio.iterative.ai/



source: https://cloud.google.com/solutions/machine-learning/mlops-continuous-delivery-and-automation-pipelines-in-machine-learning

## Don't forget



- Curb your enthusiasm...
- A data mining project should always start with an analysis of the data with traditional query tools
  - 80% of the interesting information can be extracted using SQL
    - how many transactions per month include item number 15?
    - show me all the items purchased by Sandy Smith.
  - 20% of hidden information requires more advanced techniques
    - which items are frequently purchased together by my customers?
    - how should I classify my customers in order to decide whether future loan applicants will be given a loan or not?
- Developing and deploying are entirely different beasts!